



Trust Modeling and Evaluation in Nexus

Trust Properties, Metrics and Calculi

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Outline

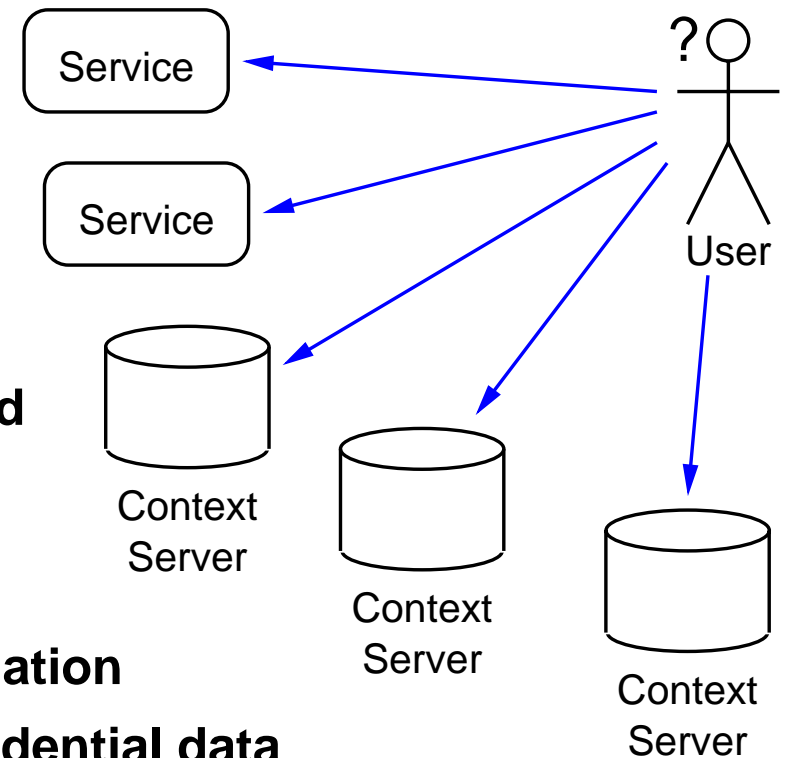
- **Motivation**
- **Trust Modeling and Evaluation**
 1. Trust Properties
 2. Trust Metrics
 3. Trust Calculi
- **Reputation Systems**
- **Conclusion**

Scenario (Nexus)

- **Open platform:**
anyone can offer
 - services
 - information sources
- **Many (possibly unknown) service and information providers**

“Who can I trust?”

- **Competence, e.g. accuracy of information**
- **Benevolence, e.g. protection of confidential data**
- ➔ **Need estimation of trustworthiness**
 - decision whether or not to use a service
 - choice of service provider / information source



Trust Estimation

First-hand knowledge

- Good / bad experience, technical knowledge, guarantees, ...
- ➔ But: **only for few services available!**

Second-hand knowledge

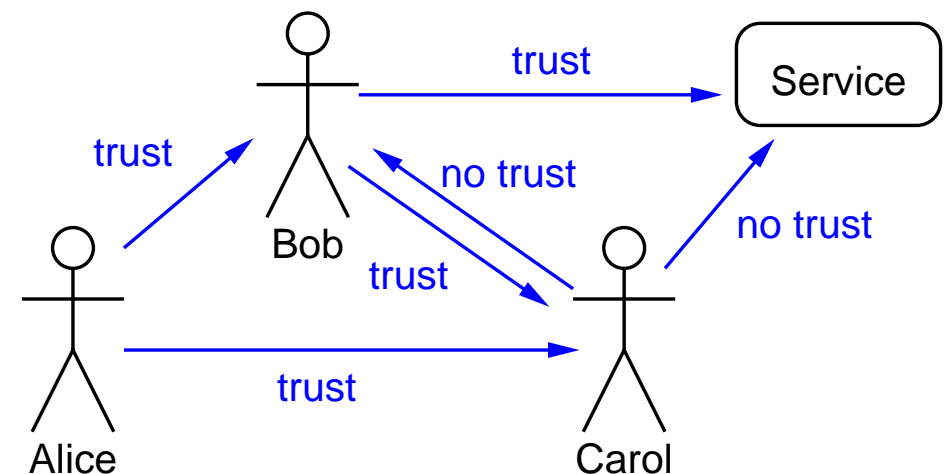
- Exchange and evaluate trust estimations of other users

“Who can I trust?”

- Malicious / incompetent users
- Conflicting opinions, uncertainty, ...

➔ Need estimation of trustworthiness of **trust estimations**

➔ **Complex** graphs of trust relations, “Web of Trust”



Trust Modeling and Evaluation

Assumption

- All users publish (**true** or **false**) trust estimations about other users and services
- User A makes **correct** and **independent** first-hand estimations about trustworthiness of other users

Goal

- Method to **combine** first-hand trust relations of all users (viewpoint A)
 - Derive second-hand trust estimations
 - **qualitatively** (“Who can I trust?”)
 - **quantitatively** (“Up to which degree?”)
 - Results should
 - comply with **reasonable intuitive expectations**
 - be robust against **attacks**
- ➔ Need a **trust model**



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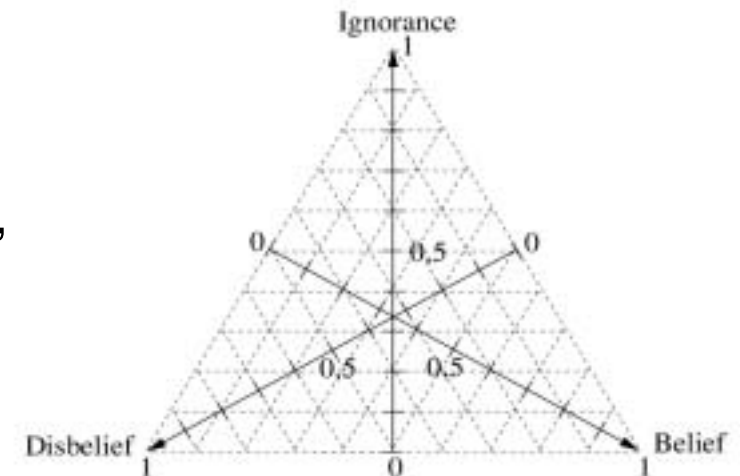


1 Trust Properties

- **Unidirectional** relation from truster to trustee (A trusts B)
- Trust is **not transitive** in general
 - “A trusts B” and “B trusts C” does **not** imply “A trusts C”
- Trust is **specific** (property, context)
- **Distinguish**
 - **direct** (functional) trust: “Trustee **has** this property.”
 - **indirect** (recommender) trust:
“Trustee can **recommend** someone who has this property.”
 - limit of recommendation hops

2 Trust Metrics (Expressing the Degree of Trust)

- **Range:** “distrust” \leftrightarrow “no trust” \leftrightarrow “trust”
 - in open systems: **negative** trust values often **not useful**
- **Default value:**
 - in open system: choose lowest possible value
- **Uncertainty required?**
- **Granularity:**
 - **discrete** values, e.g. “no trust”, “marginally trust”, “full trust”
 - **continuous**, e.g. $\text{trust} \in [0 \dots 1]$
 - **multi-value:** $\text{trust} \in [-1 \dots 1]$, $\text{confidence} \in [0 \dots 1]$
 - upper and lower bound / **opinion triangle**



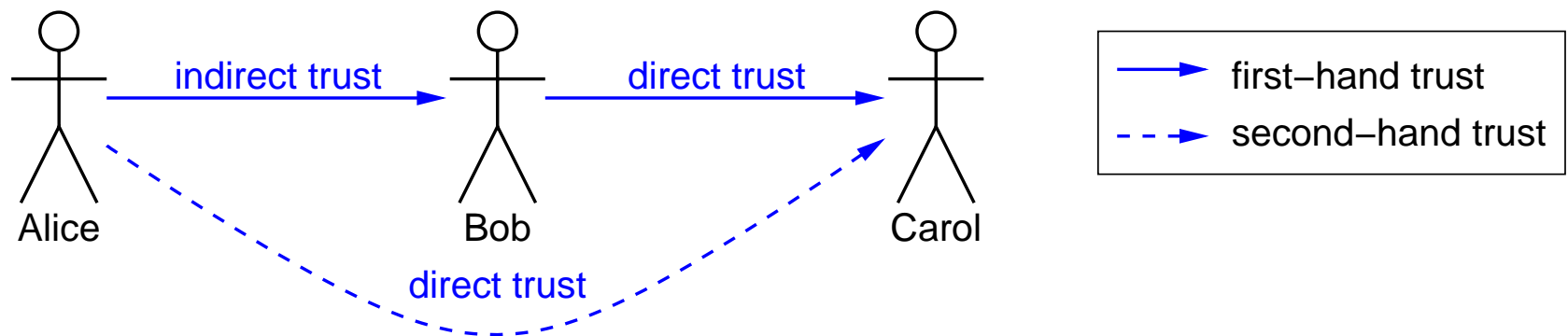
From: Audun Jøsang, “Artificial Reasoning with Subjective Logic”

Trust Calculus (1)

3 Trust Calculus (Combining Trust)

3.1 Combination Rules

- **Set of rules defining**
 - which trust relations can be **derived**
 - from set of existing trust relations
- **Example**
 - composition of **concatenation** of two trust relations
 - $\text{trust}(A, B, \text{indirect}) \wedge \text{trust}(B, C, \text{direct}) \Rightarrow \text{trust}(A, C, \text{direct})$

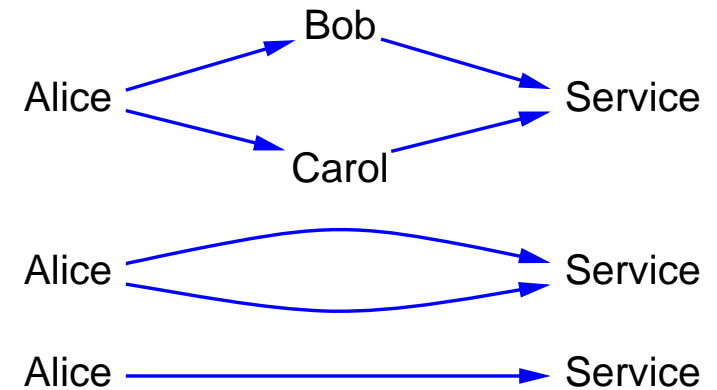


Trust Calculus (2)

3.2 Trust Calculation

3.2.1 Operator-based Trust Calculation

- **Arithmetic operator for each combination rule**
- **Combining trust values of the involved trust relations**
 - e.g. multiplication, $\min()$ / $\max()$, average, fuzzy logic operators, ...
- ➔ **Successive composition of serial and parallel trust relations**



Trust Calculus (2)

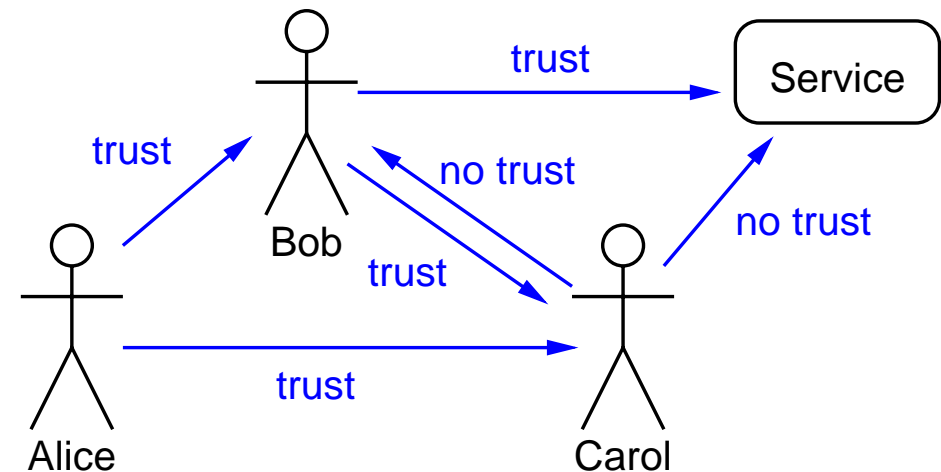
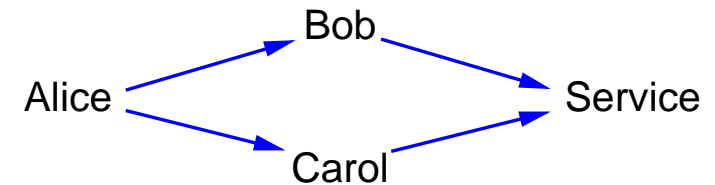
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➔ Successive composition of serial and parallel trust relations

➔ **Problem:**
only possible, if trust relation graph is a **directed series-parallel graph**



Trust Calculus (3)

3.2.2 Holistic Trust Calculation

- Interpret “trust” as “**probability** that the trustee has the named property”¹
- ➔ Trust value has a well defined semantic
- ➔ Can use **methods of probability theory**

“Possible Worlds” calculation

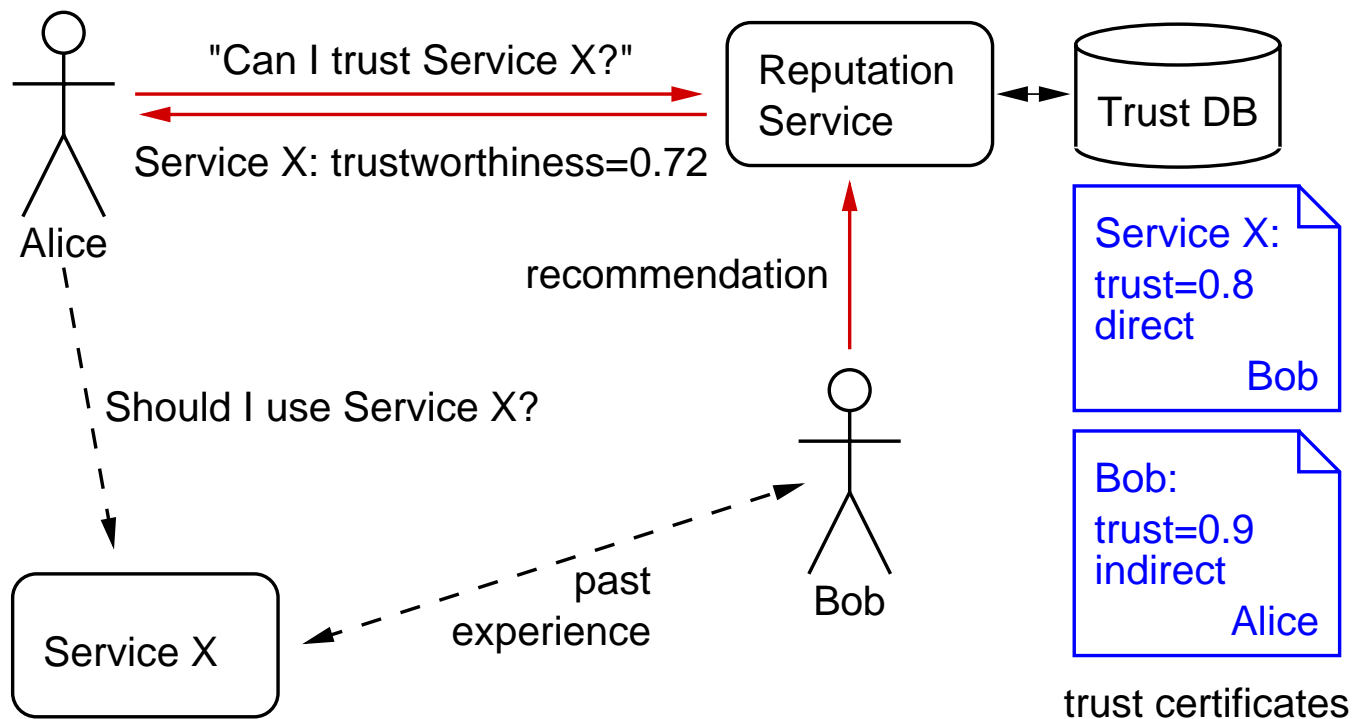
- Each trust relation can be valid or invalid
- Check for each possible combination (“possible world”), whether the intended trust relation **can be derived** or not
- Calculate the **probabilities of all “successful” worlds**
- ➔ Resulting trust value is the sum of these probabilities
 - Drawback: runtime complexity

1. Ueli Maurer, “Modelling a Public-Key Infrastructure”

Reputation Systems

Application of Trust Models in Reputation Systems

- **Trust relations** → trust certificates (digital signature)
- **Reputation Service**
 - collects trust certificates
 - search trust paths & evaluate resulting trust value



Conclusion and Outlook

Conclusion

- Trust models can be useful to combine different trust opinions
- Reputation system do **not** aim to **create** or **increase** trust, but to calculate a **precise estimation**
- Trust models must carefully distinguish
 - **direct** and **indirect** trust (transitivity)
 - **first-hand** and **second-hand** trust estimations
- **Operator-based** trust calculation → may cause **problems**
- Interpretation “**trust=probability**” → **sound basis** for trust models

Outlook

- Which trust calculus is the “**right**” one?
- Trustworthiness of **federated** services?
- Integration **reputation system** + **PKI**

